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Forensic analysis of rockfall scars

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22 **Abstract:**

23 We characterise and analyse the detachment (scar) surfaces of rockfalls to understand the
24 mechanisms that underpin their failure. Rockfall scars are variously weathered and
25 comprised of both discontinuity release surfaces and surfaces indicative of fracturing through
26 zones of previously intact rock, known as rock bridges. The presence of rock bridges and
27 pre-existing discontinuities is challenging to quantify due to the difficulty in determining
28 discontinuity persistence below the surface of a rock slope. Rock bridges form an important
29 control in holding blocks onto rockslopes, with their frequency, extent and location commonly
30 modelled from the surface exposure of daylighting discontinuities. We explore an alternative
31 approach to assessing their role, by characterising failure scars. We analysed a database of
32 multiple rockfall scar surfaces detailing the areal extent, shape, and location of broken rock
33 bridges and weathered surfaces. Terrestrial laser scanning and gigapixel imagery were
34 combined to record the detailed texture and surface morphology. From this, scar surfaces
35 were mapped via automated classification based on RGB pixel values.

36 Our analysis of the resulting data from scars on the North Yorkshire coast (UK) indicates a
37 wide variation in both weathering and rock bridge properties, controlled by lithology and
38 associated rock mass structure. Importantly, the proportion of rock bridges in a rockfall
39 failure surface does not increase with failure size. Rather larger failures display fracturing
40 through multiple rock bridges, and in contrast smaller failures fracture occurs only through a
41 single critical rock bridge. This holds implications for how failure mechanism changes with
42 rockfall size and shape. Additionally, the location of rock bridges with respect to the
43 geometry of an incipient rockfall is shown to determine failure mode. Weathering can occur
44 both along discontinuity surfaces and previously broken rock bridges, indicating the
45 sequential stages of progressively detaching rockfall. Our findings have wider implications
46 for hazard assessment where rock slope stability is dependent on the nature of rock bridges,
47 how this is accounted for in slope stability modelling, and the implications of rock bridges on
48 long-term rock slope evolution.

49 1. Introduction

50 The scar left behind after a rockfall from a rock face, commonly comprised of exposed joint
51 surfaces separated by zones of broken intact rock termed *rock bridges*, holds significant
52 insights into the conditions prior to failure, and the mechanics of that failure. Despite this, the
53 analysis of failure scars has been largely restricted to detailed post-failure analysis of single,
54 commonly large, rockfall or rockslides, rather than analysis of an inventory of multiple events
55 (e.g. Frayssines and Hantz, 2006; Paronuzzi and Sera, 2009; Sturzenegger and Stead,
56 2012). To gain insight into the influence of rock structure on stability, failure mechanisms are
57 commonly inferred from the back analysis of stability based upon the wider slopes' rock
58 mass strength (RMS), which is estimated from the combined influence of pre-existing
59 discontinuities, intact rock strength, and the degree of weathering (Barton, 1974; Hoek and
60 Brown, 1997; Jennings, 1970; Selby, 1980). The control of intact rock strength is most
61 significant at rock bridges, as they form the attachment points holding a failing block to the
62 rock mass (Jennings, 1970) (Figure 1a). Failure is known to often occur as a complex, time-
63 dependent interaction between shearing along discontinuities and progressive fracturing
64 through rock bridges, termed 'step-path' failure (Brideau et al., 2009; Jennings, 1970;
65 Scavia, 1995).

66 Structural assessment of stability is routinely undertaken through field investigation by direct
67 observation (e.g. Priest, 1993), remote sensing (e.g. Dunning et al., 2009; Sturzenegger and
68 Stead, 2009), geophysical survey (e.g. Clarke and Burbank, 2011), or intrusive ground
69 investigations such as borehole logging. However, characterising the persistence of
70 discontinuities through a potentially unstable rock slope remains challenging. As such, many
71 studies have assumed that discontinuities are fully persistent and the resulting stability
72 analysis employs a purely kinematic analysis of failure (e.g. Goodman and Shi, 1985; Wyllie
73 and Mah, 2004). Importantly however, rock bridges influence overall slope stability, and
74 experiments with limit equilibrium modelling shows even a single-digit percentage presence
75 of rock bridges as a proportion of total discontinuity length within a slope will substantially

increase the overall factor of safety (Frayssines and Hantz, 2009; Jennings, 1970). Field data from previous failures suggests a wide range in a rock bridge prevalence that is inevitably site specific, including very small percentages (0.2% to 45% as reported by: Tuckey and Stead, 2016 and references therein). In addition, prior to failure the slope can become weakened via a complex suite of weathering processes (Viles, 2013), which alter the mechanical properties of exposed discontinuities, already broken rock bridges and those, which may break in future.

The identification and attributes of significant intact rock bridges is poorly constrained in field studies, due to the difficulty of assessing their presence within the rock mass. Forensic analysis of a rockfall scar provides the most direct assessment of their role within a rockfall event (Figure 1b). However, few studies have fully characterised rockfall scars, with many focussed on specific analysis at single sites. This, combined with the wide range of reported rock bridge presence and only limited and disparate assessment of general characteristics between sites, we argue provides insufficient evidence to fully constrain the role of rock bridges in controlling rockfall (e.g. Frayssines and Hantz, 2006; Lévy et al., 2010; Paronuzzi et al., 2016).

A broader assessment, and detailed analysis of both rock bridges and other scar attributes can be used to infer the nature of stresses at the time of failure (e.g. Paronuzzi et al., 2016; Paronuzzi and Sera, 2009), subsequent failure mode (Bonilla-Sierra et al., 2015; Stock et al., 2011), the sequence of rock bridge breakage (Stock et al., 2012), and the prevalence of weathering, and hence relative age of discontinuities and rock bridge breakage. This has important implications for hazard assessment of individual slopes (Fell et al., 2008), and also for how rock strength and structure influence longer-term landform change (Clarke and Burbank, 2010; Koons et al., 2012).

To address this, we present analysis of a rockfall scar database consisting of 657 individual rockfalls, which range in surface area from 0.1 m² to 27 m². Our aim is to characterise rock

bridges within individual rockfall scars in this inventory in order to understand how they determine the type, mode and location of failure.

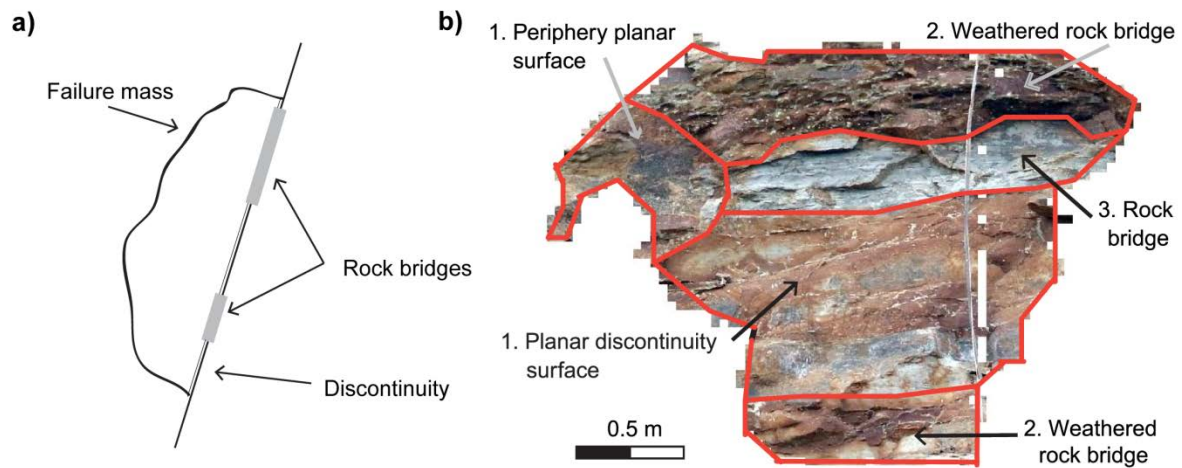


Figure 1: a) Simplified profile view of a rockfall held to a rockslope by rock bridges and a pre-existing yet not fully formed discontinuity. The incipient rockfall requires the rock bridges separating the discontinuities to be broken before failure can occur. b) Example high resolution photograph of a siltstone rockfall scar, from North Yorkshire coastal cliffs, U.K. The scar contains discontinuities of varying persistence, plus three separate broken rock bridges that have been variously weathered, as indicated by the surface colour. Analysis of the age of the features, as indicated by their weathering, suggests the order of failure, with the discontinuity surfaces forming first, before fracturing and weathering of rock bridges, and the final fracture of a freshly exposed rock bridge.

2. Study Site

We monitored a 200 m section of near-vertical cliffs at Staithes, North Yorkshire, UK over a 13-month period to document and characterise rockfall activity (Figure 2). The rock portion of the cliffs is ~60 m in height, and located on a storm-dominated macro-tidal coastal

environment. The 200 m survey section contains a lower shale unit (~10 m high, extending from the cliff toe at mean high water level), an upper shale unit (~32 m high) and an interbedded siltstone and sandstone unit (~12 m high), capped by a glacial till (Figure 2c). These form part of the Lower Jurassic Redcar Mudstone and Staithes Sandstone formations (Rawson and Wright, 2000). All units display a bedding dip of 2° to the south-east, which is broadly orthogonal to the northern aspect of the cliff face, and a complex discontinuity pattern, which varies in orientation and persistence between the interbedded layers in each major rock type. From field mapping, the dark blue-grey lower shale unit is slightly weathered with some surficial algal cover, is moderately strong to strong, and has indistinct bedding with iron-stone bands throughout, as well as a widely spaced joint pattern of varying persistence (classification based on ISRM, 2015). The upper shale unit is similar with a dark blue-grey colouring, slightly weathered, is indistinctly bedded with ironstone bands, and is moderately strong to strong. However, its joint pattern shows a greater variance in spacing. The interbedded siltstones and sandstones are comprised of gradational beds of silt and sand, which can be up to 3 m in thickness, and display a widely spaced (~2 m) 'blocky' joint pattern with narrow to widely dilated joints. It is slightly weathered, is light blue-grey, and moderately strong to strong.

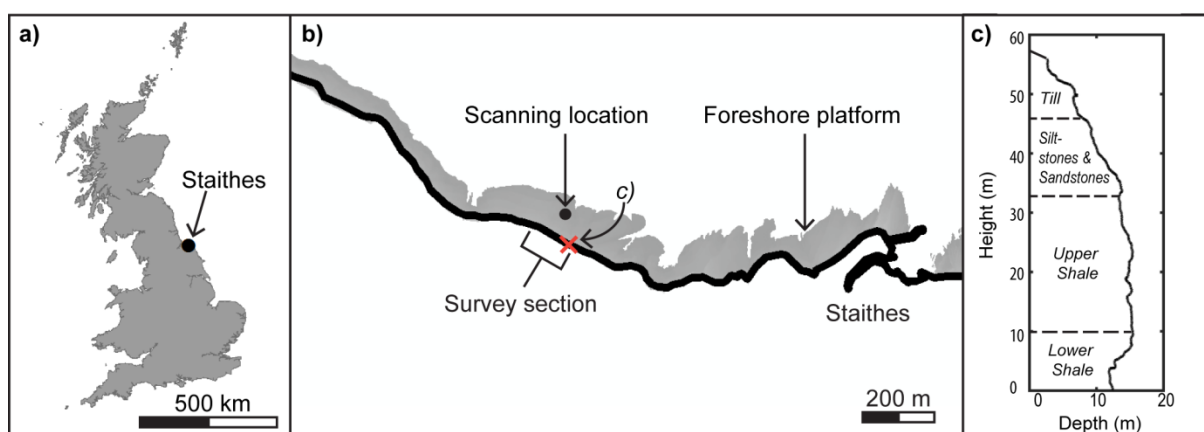


Figure 2: a) Location of Staithes, North Yorkshire, UK. b) Map view of survey section and scanning location at Staithes. The location of the cliff cross-profile section presented in c), is indicated by the cross. c) Typical cliff and lithological profile of the survey section.

3. Methods

3.1. Overview of approach

Understanding the role of rock bridges and weathering in controlling failure behaviour requires complete characterisation of scar surface attributes. Both high resolution imagery and 3D models of the rockfall scars derived from pre- and post-failure topography are required to create and collate the scar database. From this, we undertook detailed analysis of the rockfall scar texture, structure and colour to quantify the properties of broken rock bridges and conversely discontinuities. This involves not only understanding the proportion of each element within an individual failure surface, but also their distribution, orientation and location with respect to the overall rockfall scar. Given the near-vertical cliff face and the typical nature of rockfall on these cliffs (see: Rosser et al., 2013), we assume that blocks delimited by pre-existing discontinuities alone must fall instantly in response to rock bridge failure in an adjacent supporting block and so are indistinguishable from rockfall controlled by rock bridges.

Firstly, we define the areal proportion of rock bridges ($\%rb$) and weathered surfaces ($\%w$) within each individual rockfall scar as a percentage of the total scar surface area, and proportion of weathered rock bridges ($\%wrb$) as a percentage of individual rock bridge area. Respectively, these characteristics control slope stability (Jennings, 1970), indicate the exposure to environmental processes (Viles, 2013), and places limits on the temporal order of failure (Stock et al., 2011). Secondly, we constrain if fracturing through rock bridges is either uniformly distributed across the rockfall scar, or is more locally concentrated. The distribution of rock bridges determines the location, direction and magnitude of stress concentration at each attachment point that supported the rockfall prior to release. Thirdly, we determine the locations of rock bridges with respect to the critical slip path, which influences the stress required for failure along this orientation (Tuckey and Stead, 2016). Fourthly, we analyse the location of a rock bridge within a rockfall scar relative to its centre

of mass, which represents the location about which forces act and rotation occurs (Hibbeler, 2010). This places controls on failure mode, with simple moments indicating if failure was most likely in tension or shear (Bonilla-Sierra et al., 2015; Stock et al., 2011).

3.2. Rockfall inventory & descriptors

We collected repeat terrestrial laser scanning (TLS) surveys of a 200 m section of coast on an approximately monthly basis over a 15 month period (June 2015 to September 2016) (Figure 2). A Riegl VZ -1000 laser scanner was consistently positioned ~100 m from the cliff toe to collect 3D point clouds with spacing of 0.01 m to 0.02 m. From this, we undertook 2.5D change detection of the sequential cliff surfaces using the approach detailed in Rosser et al. (2005), which assumes that the cliff face can be approximated to a 2D planar surface. Triangular irregular network (TIN) models were created of the pre- and post-failure topography and combined to form a 3D rockfall model, from which we calculated centre of the mass, volume and dimensions, assuming a uniform rock density.

We captured high resolution photography to provide information on surface texture, discoloration due to weathering and context for interpreting the 3D scan data. We collated gigapixel panoramic images of the cliff face on an approximately monthly basis over 13 months (August 2015 to September 2016) from the same foreshore position as the TLS (Figure 2). We used a 50 MP Canon EOS 5DS R camera with a 300 mm telephoto lens, in conjunction with a Gigapan Epic Pro mount. The individual photos were stitched into one panoramic image (8,688 by 5,792 pixels), achieving an on-cliff pixel resolution of 0.001 m to 0.002 m (Figure 3). We manually adjusted aperture, shutter speed and ISO depending on conditions to capture sharp, high-quality images.

Each panoramic image was overlaid on the DEM collected in the same month. We geo-referenced the image using a spline transformation with at least 200 control points. Rockfall scars were extracted from the Gigapan images using the rockfall locations extent from the

change measured using the TLS data comparison. Rockfall scar images that had undergone distortion or warping of pixels during geo-referencing were manually deleted from the database.

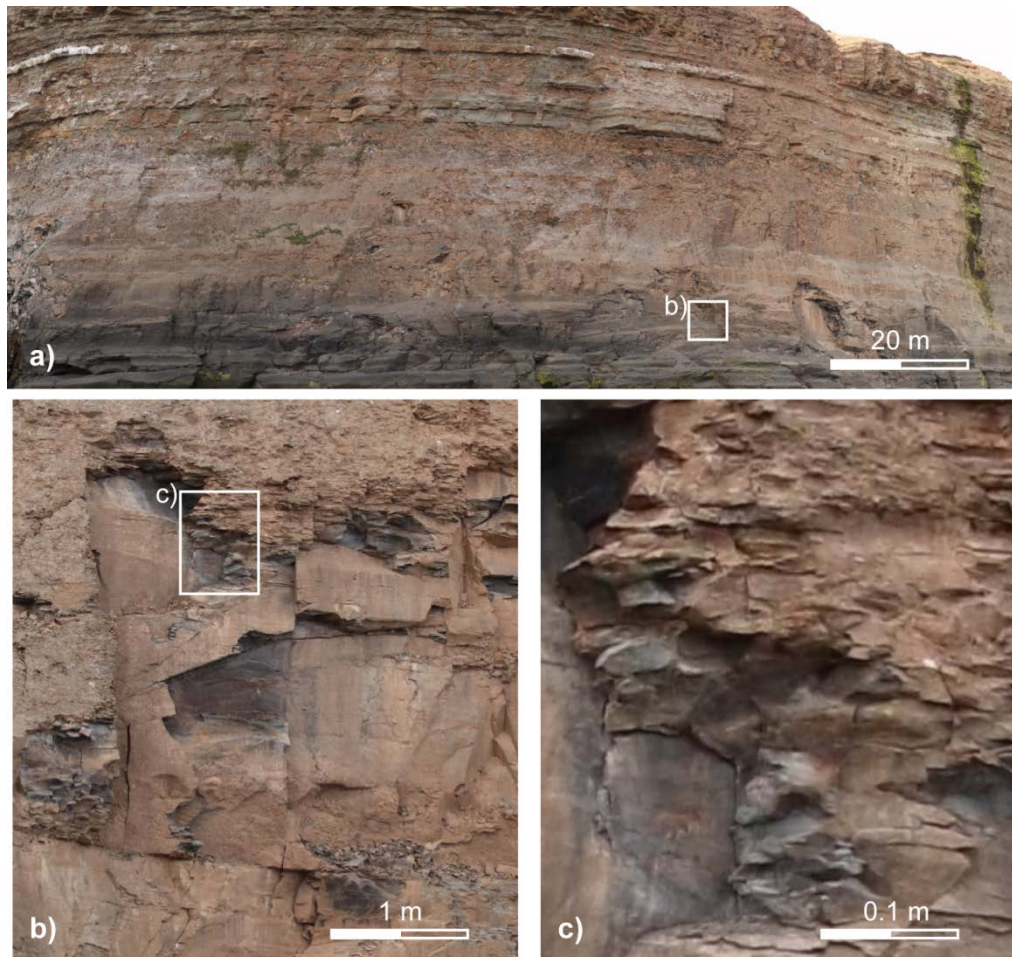


Figure 3: a) Panoramic gigapixel image of the monitored cliff section. b) Close-up of a rockfall scar. c) Close-up of a freshly broken rock bridge.

3.3 Data Processing

Over the survey period we identified a total of 657 rockfall scars with $> 0.1 \text{ m}^2$ surface area. We consider it unlikely that failures smaller than 0.1 m^2 are controlled to the same degree by the interaction of discontinuity release surfaces and rock bridges due to large discontinuity

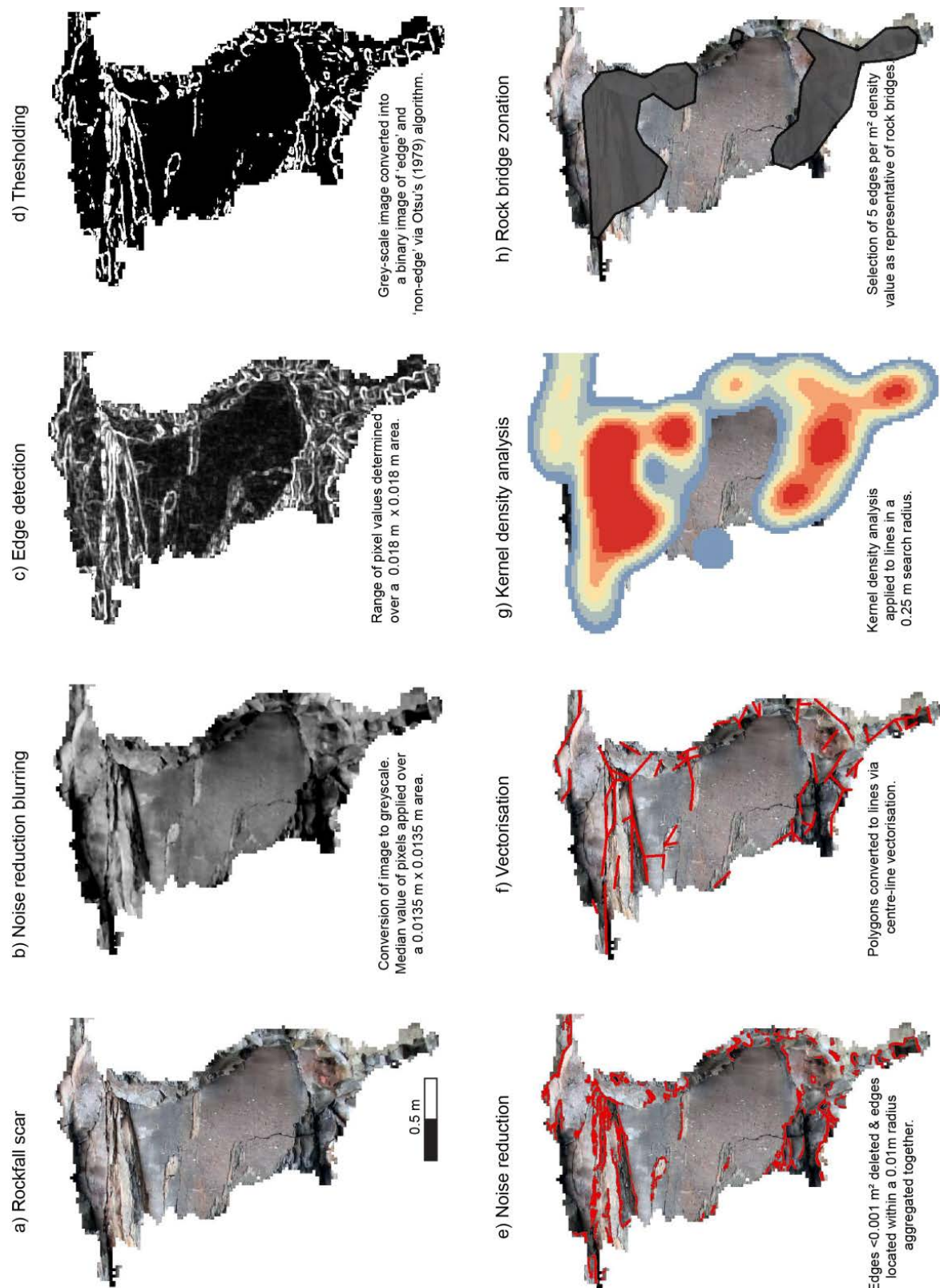
spacing (> 2 m) and the relatively high strength of the cliff rock as compared to small rockfall volume (mass), and so these were not included in the analysis.

We automated the classification of rockfall scar features to avoid the subjectivity associated with manual classification. This automated process involved a routine to classify areas of fracture through rock bridges within the scar surface imagery. Inspection of the imagery revealed that broken rock bridges in rockfall scars on these cliffs are characterised by rough surfaces with micro-topography comprised of small (cm – scale) planar segments separated by small (10^{-1} - 10^1 cm) linear edges, as compared to the smooth and planar pre-existing discontinuity surfaces. High numbers of contiguous small segments and edges represent the remnants of failed rock bridges in the scar surface. We also undertook automated colour classification to identify discoloured surfaces indicative of weathering.

3.3.1 Edge Detection

To discretize the scar surface into zones of broken rock bridges and pre-existing discontinuities, we developed a method to delimit areas of similar texture within the scar. We employed an automated image classification technique, based upon the RGB values in the high-resolution optical imagery, adapting an approach used for petrographic grain boundary detection, developed by Li et al. (2008). This involves four stages outlined in Figure 4, namely: edge detection, noise reduction, vectorisation and density classification. Edges were detected by the contrast of light to dark tones in pixel values, indicative of shadowing created by rough surfaces (Figure 4a). To enhance contrast, images were converted to grey-scale and smoothed by obtaining and applying a median pixel value over a specified area to reduce small scale noise (Figure 4b). As fractures are likely to have linear features and be continuous within patches, pixel contrasts less than the smoothing area were considered noise. The range in pixel values was calculated over a kernel size of 12 by 12 pixels or 0.018 m by 0.018 m, which retained resolution but remained insensitive to gradual shifts in tone

and/or colour due to natural lithological or weathering variations (Figure 4c). This kernel highlighted only abrupt changes in pixel values, and as such identified those areas more related to fracturing of intact rock. As an individual rockfall scar assessment of relative pixel value range, this approach is insensitive to larger scale (e.g. month to month) variations in ambient colour, and lighting. The pixel value range was converted into a binary using Otsu's (1979) thresholding algorithm, allowing classification of the scar surface into zones of 'non-edges' and 'edges' (Figure 4d). As this was a relative threshold value set via cluster analysis of grey-scale pixel histogram rather than a pre-determined absolute value – it allowed areas of relatively higher pixel contrast to be separated from areas of relatively lower pixel contrast for each rockfall scar. As a second stage of noise reduction, fracture zones < 0.002 m in length were omitted and those with tips within a 0.01 m area were conjugated to form a continuous single 2D zone feature (Figure 4e). Zones of fracture edges were converted into polylines using a centre-line vectorisation, whereby proximal collinear edges within 0.0225 m were merged (Figure 4f). The line features allowed densities of fractures to be obtained using a kernel with radius of 0.25 m (Silverman, 1986), which retained detail whilst simplifying small-scale noise (Figure 4g). This produced coherent zones, which described low to high edge densities across the rockfall scar surface (Figure 5). Areas of higher density indicated fracturing through a broken rock bridge (Figure 4h), verified by visual comparison of a subsample of the classified inventory.



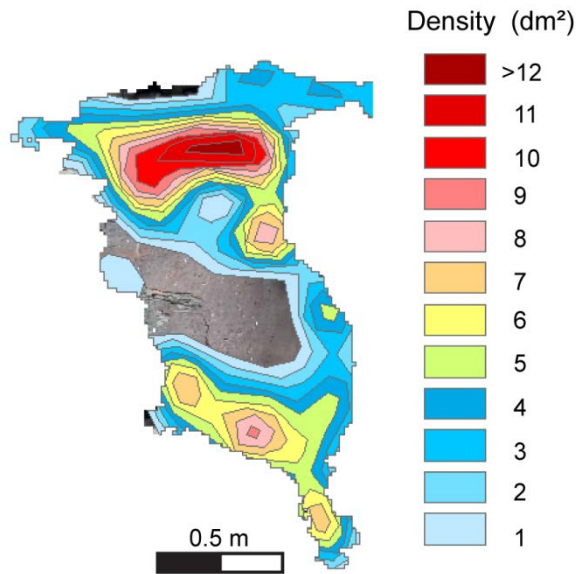
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Figure 4: Detailed stages of edge detection from the original image (a), through initial noise reduction (b), to edge detection algorithms(c-d), further noise reduction (e), and density analysis of edges (f-h).



256

257 Figure 5: Density classes derived from kernel density analysis of edges within rockfall scars.

258 Density increases from 1 edge per m^2 to ≥ 12 edges per m^2 within this rockfall, though

259 densities >15 edges per m^2 occur within the database. The incremental density value is

260 simplified as dm^2 .

261

262 3.3.2 Rock bridge determination

263 Based upon the density of features derived using the image classification, a threshold that

264 identifies a 'rock bridge' from other areas is needed. To determine the edge density range

265 over which features are classified as rock bridges we analysed a subset of the rockfall

266 database, which consisted of a random sample of 163 rockfall scars $> 0.1 m^2$ recorded

267 between the two monitoring intervals of 25/11/2015 and 26/01/2016,. This sub sample

268 contained a wide range of rockfall sizes and respective lithologies. Individual rock bridge

269 areas were derived from incrementally increasing density values between 1 - 15 edges per

270 m^2 (dm^2). Mean, median, interquartile range and the number of observations of individual

271 rock bridges (*rb_count*) for each dm^2 value were determined to evaluate the success of the

272 classification (Figure 6). The *rb_count* within a scar peaks at density values of five dm^2

before decreasing. At lower dm^2 rock bridges are conjoined, resulting in a lower number of observations, before features become separated into several individual rock bridges when using higher dm^2 (Figure 5). Above five dm^2 the numbers of observations decreases as some areas no longer contain enough features to be classified as a rock bridge by the kernel density analysis.

The mean, median and interquartile range of individual rock bridge areas decreases with increasing dm^2 . On the basis of this, and in consideration with the peak rb_count , we selected a density of five dm^2 for classification. Visual assessments of (>50) rockfalls scars confirmed that this was a 'best-fit' for areas of dense fracturing. Additionally, we calibrated this method with manual mapping of a subsample of 15 rockfall scars, which derived descriptive statistics comparable to and within the margin of error of each (Table 1). Visual comparison reveals that the relative location and proportion of rock bridges predicted by both methods are comparable (de Vilder et al., 2017).

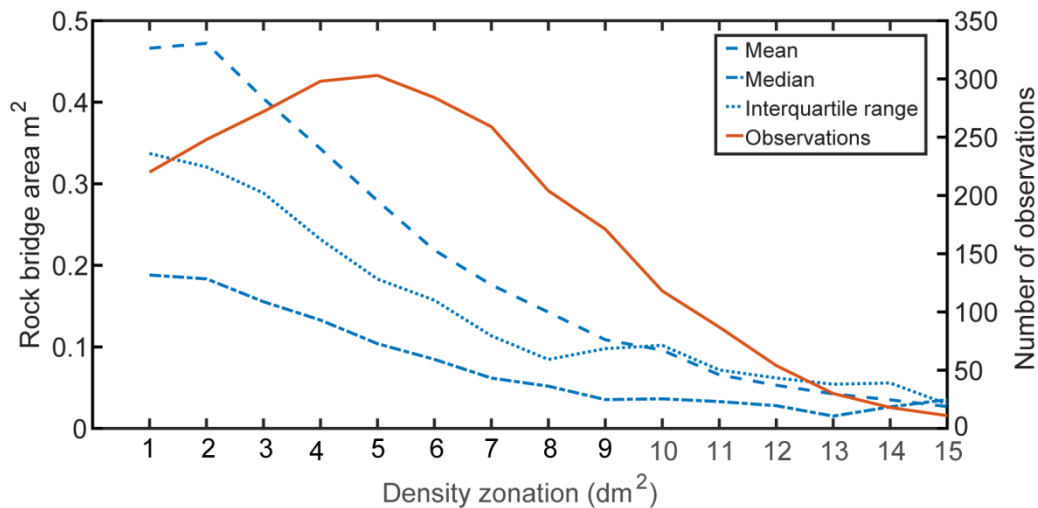


Figure 6: Descriptive values of rock bridge area recorded from different density values. These densities are determined from kernel density analysis of edges recorded within rockfall scars. They increase from 1 dm^2 to $\geq 15 dm^2$.

Table 1: Descriptive statistical comparison between automatic and manual classification of the rock bridge scar surface area.

	Mean (m ²)	Std.dev. (m ²)	Median (m ²)	Margin of error (99% confidence)*	Count
Automatic Classification	0.318	0.499	0.102	0.100	74
Manual Classification	0.191	0.283	0.100	0.157	64

*Due to differences in sample size a *z* (99%) and *t* (99%) confidence interval were used for the automatic (*n* >30) and manual methods (*n* <30) respectively.

3.3.3 Weathering surface classification

We classified rockfall scars into categories to constrain the role of weathering-controlled strength degradation along discontinuities, and within rock bridge fracture (Viles, 2013). Classification was based on RGB pixel values to represent the intensity of rock weathering relative to virgin rock (Figure 7a). We manually chose characteristic RGB histogram ranges, consisting of 25 RGB samples selected to cover a wide range of different surfaces and lithologies exposed upon the cliff. These 25 samples were further classified into five categories determined via histogram evaluation and visual assessment as: unweathered, shadow, biologically weathered, slightly weathered/till covered and moderately weathered. The glacial till that caps the cliff (Figure 2) and drape debris over the cliff face making the distinction between the till cover and slightly weathered surfaces at times ambiguous. Biologically weathered surfaces contain a coating of green algae, and are often present on rockfall scars within the tidal inundation zone at the base of the cliff. To characterise the broader pattern of weathering within rockfall scars, we selected the dominant weathering types (Figure 7c). As part of this broad assessment, moderately weathered, slightly

weathered/till covering and biologically weathered surfaces were combined and simplified to create a single weathered category.

We calibrated this automatic method with a manually mapped database. Comparison of descriptive statistics for 15 rockfall scars (Table 2), reveal that the mean and median values are comparable and within the calculated margin of error. Visual assessment of automated results is comparable to the hand mapped interpretations (de Vilder et al., 2017)

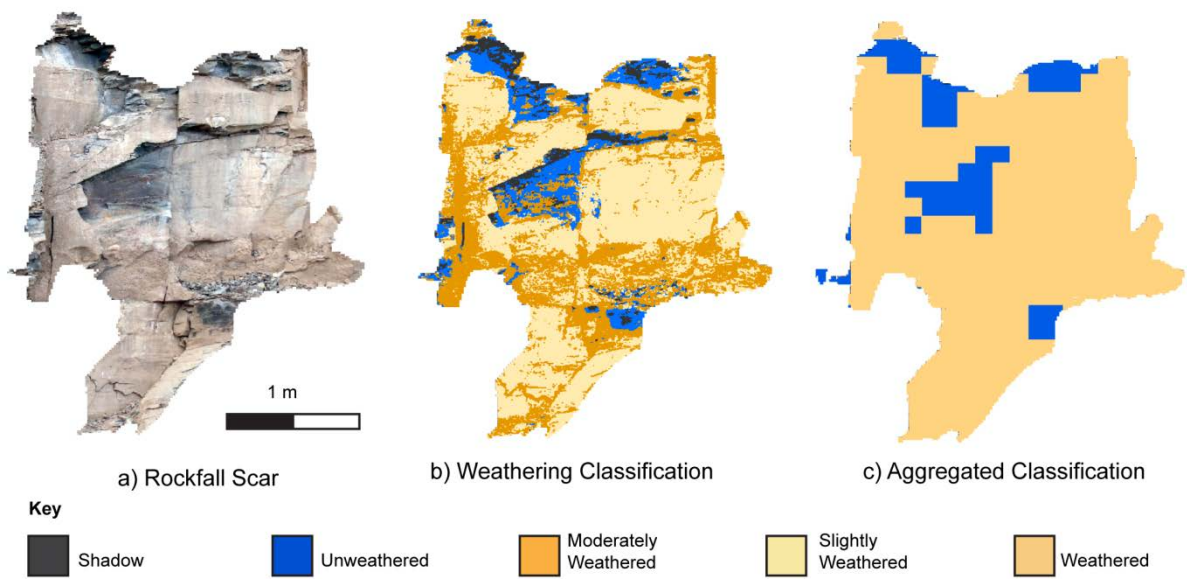


Figure 7: Automated weathering surface classification of rockfall scar surface (a) into a detailed 5 category classification of individual pixels (b) and a broader classification of 3 categories based on a 100 by 100 pixel area (c). Categories are outlined in the key.

Table 2. Descriptive statistical comparison between automatic and manual classification of the weathered scar surface area.

	Mean (m ²)	Std.dev. (m ²)	Median (m ²)	Margin of error (99% confidence)*	Count
Automatic Classification	0.264	1.044	0.025	0.212	148
Manual Classification	0.237	0.351	0.089	0.194	82

* Due to differences in sample size a *z* (99%) and *t* (99%) confidence interval were used for the automatic (*n* > 30) and manual methods (*n* <30) respectively.

4. Results and Interpretation

4.1 Rockfall characteristics

Rockfall scars in the database (*n* = 657) had a mean surface area of 0.652 m² (Table 3), with 13% of rockfall scars having a surface area > 1 m². We use scar surface area as a metric for rockfall size, as it provides a consistent comparison with %*rb* and %*w*, and has positive linear relationship with measured rockfall volume (*r* =0.927, *p* = -0.033). Rockfalls are distributed from across the cliff face, with the highest concentration observed in the shale units (54% in the upper shale and 28% in the lower shale). Fewer interbedded siltstone and sandstone rockfalls are captured due to their location within the cliff face. These events were commonly discarded due to pixel distortion as a result of both the relative steep angle of data capture and nature of ‘stretching’ the panoramic image over the protruding sandstone and siltstone beds. .

Table 3: Characteristics of rockfall volume, area and simple geometric variables within the database.

	Area (m ²)	Volume (m ³)	Width (m)	Height (m)	Depth (m)
Mean	0.652	0.236	1.076	0.893	0.652
Median	0.233	0.043	0.760	0.660	0.494
Std.dev.	1.534	1.208	0.971	0.722	0.547
Min	0.100	0.010	0.260	0.083	0.175
Max	26.912	27.003	9.560	6.160	3.956
Range	26.812	26.993	9.300	6.077	3.781

4.2 Rockfall scar characteristics

4.2.1 Rock bridge and weathering proportions

The distribution of %rb displays a wide range in values with a skewness of 0.4, and peak in observations for < 2 %rb (Figure 8a). This includes rockfalls with no rock bridges, which account for 20% for rockfalls within the database. Such rockfall are predominately < 0.2 m² with a maximum scar surface area of 1.66 m² (Figure 9). Excluding this subset, %rb values are normally distributed with a wide range in values from 0% to 97.6%, and a mean value of 31% ± 26% and a median of 29% (Figure 8a and Table. 4). Individual rockfall scars therefore display a large range in the proportion of their surface that comprises broken rock bridges.

To understand what drives this large range in %rb values, we assessed rockfall volume and lithological differences. Rockfall scar area showed no correlation with %rb ($r = -0.122$, $p = 0.006$), with a wide scatter in %rb. Comparison of descriptive statistics between the three lithologies revealed a 10%rb difference by rock type (Table 4). The lower shale displayed the lowest %rb (26.7%) and interbedded siltstones and sandstones displayed the highest (%rb =

34.7%). A similar pattern is observed for the median values of %rb. Analysis of variance indicates that the lower shale unit had a statistically-significant ($p = 0.01$) lower mean %rb than that of the upper shale and siltstone/sandstone units. Therefore, %rb varies as a function of lithology but not with increasing rockfall size. The different lithological units, and their associated rock mass structure, can be considered a critical influence on the prevalence of rock bridge proportion within the scars (and therefore rockfalls) that each unit generates.

%w has a bimodal distribution whereby rockfalls are generally characterised by either <4 %w, or more strongly at values of >98 %w surface weathering (Figure 8b). There is a wide but consistent range in values between these two end members, which generates a mean value of $49.7\% \pm 34.9\%$, and a median of 48.9%. Surfaces with >98 %w correspond to the peak in values for <2%rb, suggesting that rockfalls with nearly 100%w contain 0%rb. However, as the peak is larger for %rb, some of these scar surfaces with no rock bridges must have been partly unweathered prior to failure. This suggests that %w is not solely related to discontinuity occurrence within the rockfall scar, and as such must be related to weathering of already broken rock bridges. The wide range in values also indicates that discontinuity connectivity within the rock mass influences the distribution of weathering across the scar surface prior to failure.

%wrb has a similar bimodal distribution to %w with rock bridges strongly >98%wrb or <20 %wrb, and a wide consistent range in values (Figure 8c). %wrb has a mean value of $43.51\% \pm 35.19\%$, and a median value of 35.5%. Most rock bridges however are only partly weathered, with 79.95% of all rock bridges containing <50%wrb, and %wrb overall accounts for 12.99% of total rock bridge area. This may be a function of the areal aggregation during classification and the ambiguity of classifying till covered/slightly weathered surfaces (Figure 7), introducing an element of uncertainty in this result. As such, we suggest that the broad pattern of these results rather than the exact %wrb value is more important. The result implies that some rock bridges within the rock mass have been either partially or completely

fractured before final failure of the rockfall, and these fractured surfaces have been exposed for a significant periods of time for surficial weathering and discolouration to take place.

Table 4: Descriptive statistics for %rb based on geology

	Mean	Std.dev.	Median	Max	Min	Count
All	30.8	25.8	28.9	97.6	0	657
Lower Shale	26.2	26.7	20.3	97.6	0	184
Upper Shale	31.9	25.1	31.2	95.3	0	356
Siltstone/Sandstone	34.7	25.9	36.2	93	0	117

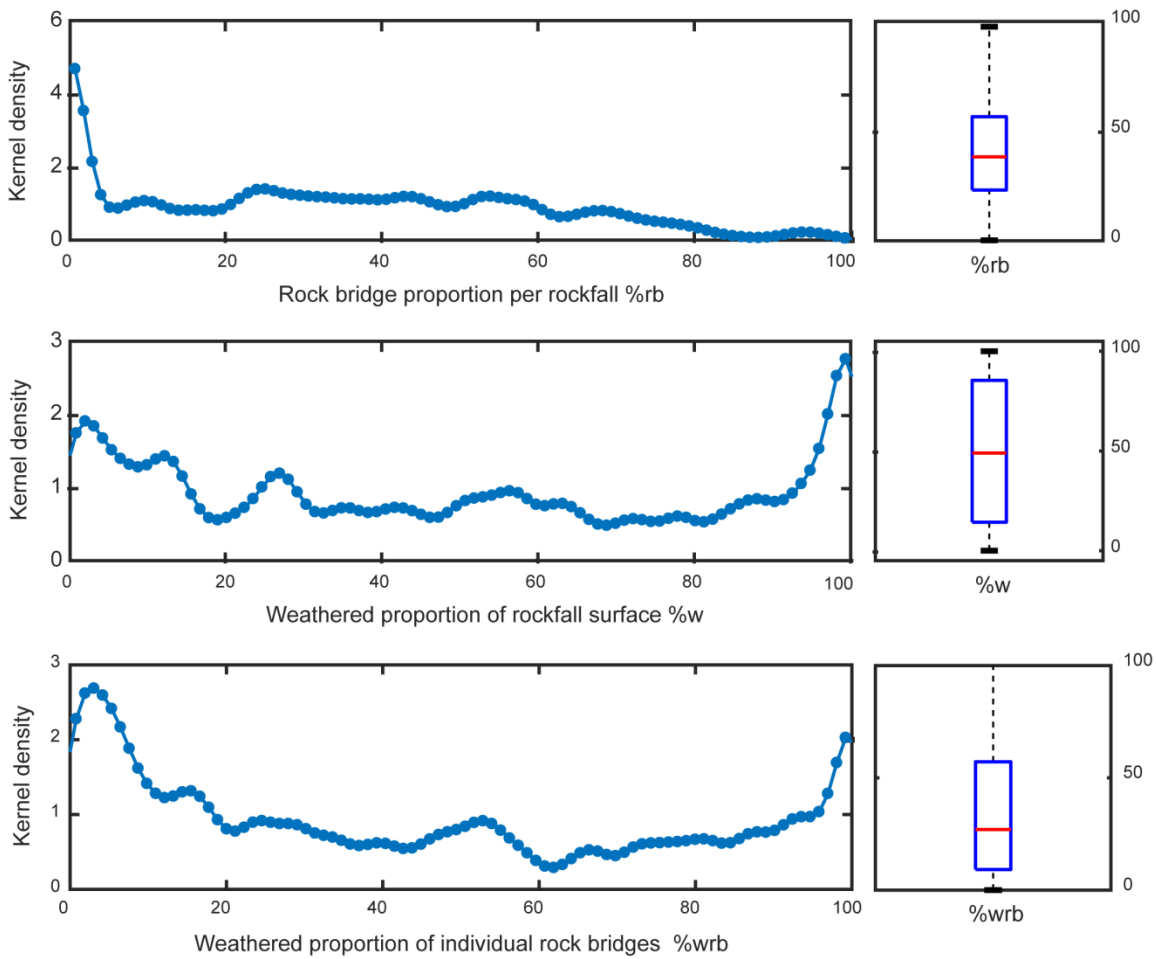


Figure 8: Histograms and box plots of a) %rb and b) %w and c) %wrb.

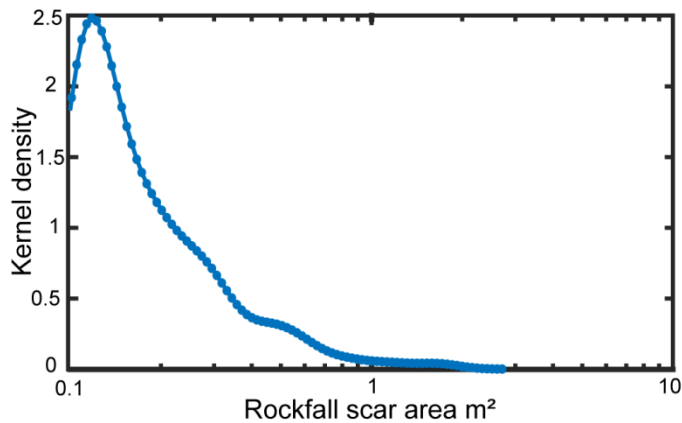


Figure 9: Kernel density plot of the area distribution of rockfall scars recorded with no rock bridges.

4.2.2. Rock bridge distribution

Rockfalls have a median value of one rock bridge per scar, with a mean value of 1.8 ± 2.2 . The number of rock bridges per scar has a significant positive linear correlation with increasing rockfall scar area ($r = 0.928$; Figure 10a). This demonstrates that larger rockfalls contain more individual rock bridges, as opposed to larger rockfalls purely being larger versions of their smaller counterparts. Mechanically, larger rockfalls may therefore behave and fail in a manner quite different to smaller rockfall, and so may be sensitive to a different set of conditions, controls or thresholds on failure. Around 0.5 m² scar surface area, rockfalls tend to contain ≥ 2 rock bridges, with the trend indicating that rockfalls with 1 m² surface area are most likely to contain two or more rock bridges. This indicates that, in broad terms for every 0.5 - 1 m² of increasing rockfall scar surface area, there is one additional rock bridge holding the block to the rock face. Individual rock bridge area is predominantly measured to be c. 0.1 m² (Figure 10). A 0.5 m² rockfall surface area that contains a 0.1 m² rock bridge adheres to the mean $\%rb$ estimate.

Within each rockfall scar, we examined the areal extent of the individual rock bridge(s) (Figure 10b). We compared the relative area of the largest rock bridge within the scar to all the other rock bridges within the same scar. Our analysis identifies that for rockfalls with <5 rock bridges, one main rock bridge dominates the scar surface, with smaller peripheral bridges. As the number of rock bridges increases the dominance of a single bridge decreases, as the fraction of the scar rock bridge area occupied by the largest rock bridge as compared to all other rock bridges reduces. This suggests that for larger rockfalls with > 5 rock bridges in the inventory, rock bridges tend to be of a similar surface area. Conceptually, and assuming a homogenous rock mass structure, as the failure scar surface area grows it incorporates more rock bridges. With increasing rockfall volume, fractured rock is distributed across multiple bridges of similar size, rather than concentrated in one primary rock bridge. By implication the perimeter to area ratio of rock bridges changes with rockfall volume, which exposes a greater area of the supporting rock bridges to be exposed to weathering within the rock mass.

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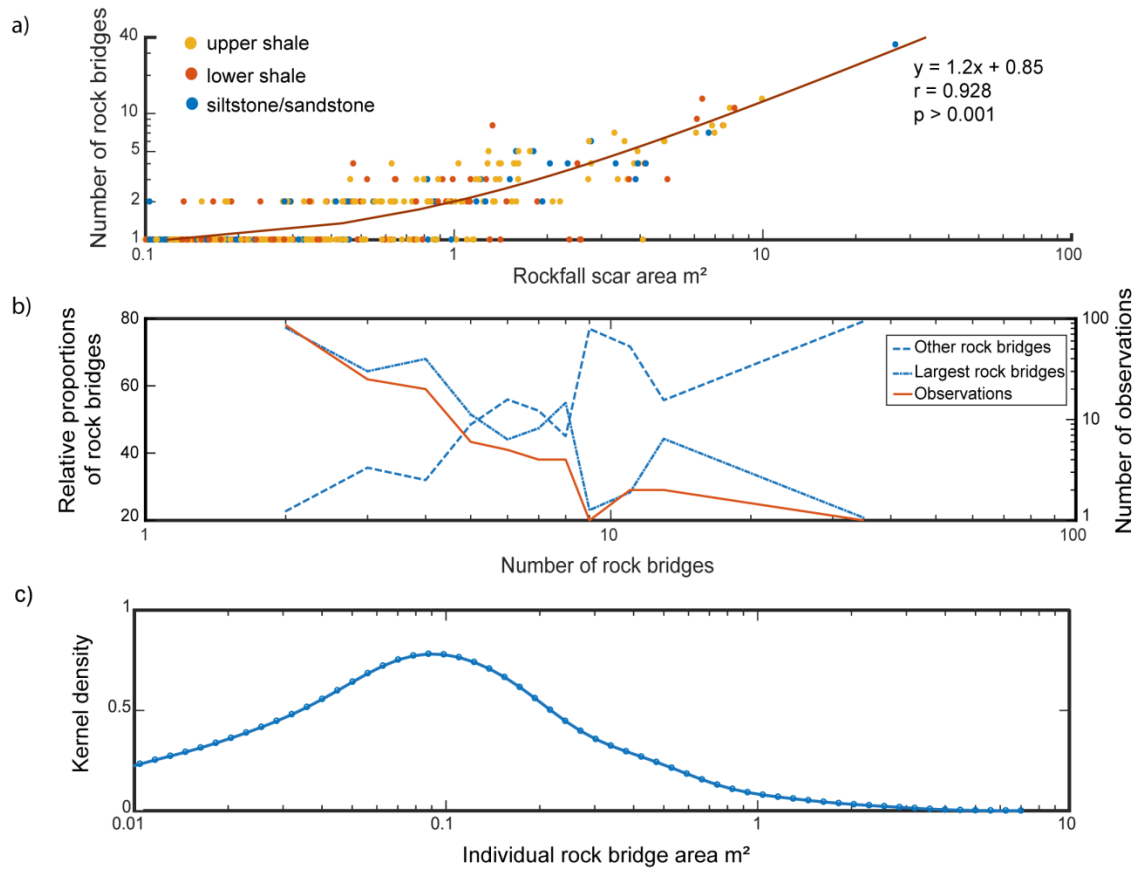


Figure 10: a) Scatter plot displaying a positive linear trend between number of rock bridges per scar and rockfall scar area. b) Mean values of the relative proportion of the largest rock bridge within an individual scar compared with the proportion of all other rock bridges within an individual scar. For example, if a rockfall scar contains two rock bridges, the largest accounts for 80% of rock bridge area while the other accounts for only 20 %. The number of observations for the calculation of mean values is plotted on the right axis and decreases with increasing rock bridges. c) Kernel density plot of individual rock bridge area distribution, displaying that most rock bridges are 0.1 m².

4.2.3 Rock bridge orientation

We assessed the orientation of rock bridges with respect to rock bridge planarity relative to the main failure surface. We compared the mean slope and aspect (derived from the cliff

face surface topography model) of the rock bridges with that of the overall aspect and slope of the scar surface (Fig 11a). Slope and aspect are comparable to the dip and dip direction, respectively, of a discontinuity given the projection of the cliff face data employed here. Scar aspect was measured relative to cliff normal (Figure 2b) and as such represents deviations from the cliff face aspect. From this we derived a mean aspect value of $173.7^{\circ} \pm 53.1^{\circ}$, indicating that the most rockfall scars are oriented approximately parallel to the cliff face.

We define rock bridges as co-planar with the main failure surface, if both slope and aspect are $\leq 15^{\circ}$ from scar surface orientation. Due to the relatively small failure size and based on field observation, we assumed rockfalls scar surfaces contained one main planar failure surface, and therefore co-planar rock bridges are also in-plane with this surface. We define rock bridge deviations in slope and aspect of $>15^{\circ}$ as non-planar. Our definition of non-planar bridges does not necessarily distinguish in-plane rock bridges along intersecting joints from out-of-plane rock bridges located between discontinuities of differing orientations. 69.5% of rock bridges were defined as predominately co-planar, with 30.5% predominantly non-planar. Rockfalls that contain both non-planar and co-planar rock bridges account for 14.8% of events in the inventory. For these rockfalls, scars are dominated by co-planar rock bridges (97%), with non-planar rock bridges forming only a minor component of the total scar. Therefore, nearly all rockfalls which contained both non-planar and co-planar bridges were accounted for within the 69.5 % of rock bridges which are predominately co-planar. This suggests that lateral release surfaces related to discontinuities striking perpendicular to the cliff face contain fewer rock bridges. Assessment of mean %rb between co-planar and non-planar rock bridges reveals that non-planar rock bridges show a higher proportion (51.1%rb) compared to co-planar (35.4%rb) (Figure 11b). Analysis of variance indicates that this difference is statistically significant ($p > 0.001$), so although non-planar rock bridges are less prevalent in our dataset, when they are recorded, their %rb is normally higher. Analysis of the distribution of co-planar versus non-planar rock bridges shows that (larger) rockfalls with multiple rock bridges are less likely to contain non-planar rock bridges (Figure 11c).

Therefore, non-planar rock bridges are limited to smaller rockfalls, which as identified previously, tend to contain only one rock bridge. These smaller rockfalls are more likely to be associated with discontinuity surfaces, which comprise rock bridges, whereas the larger rockfalls have fractured both through and across discontinuities.

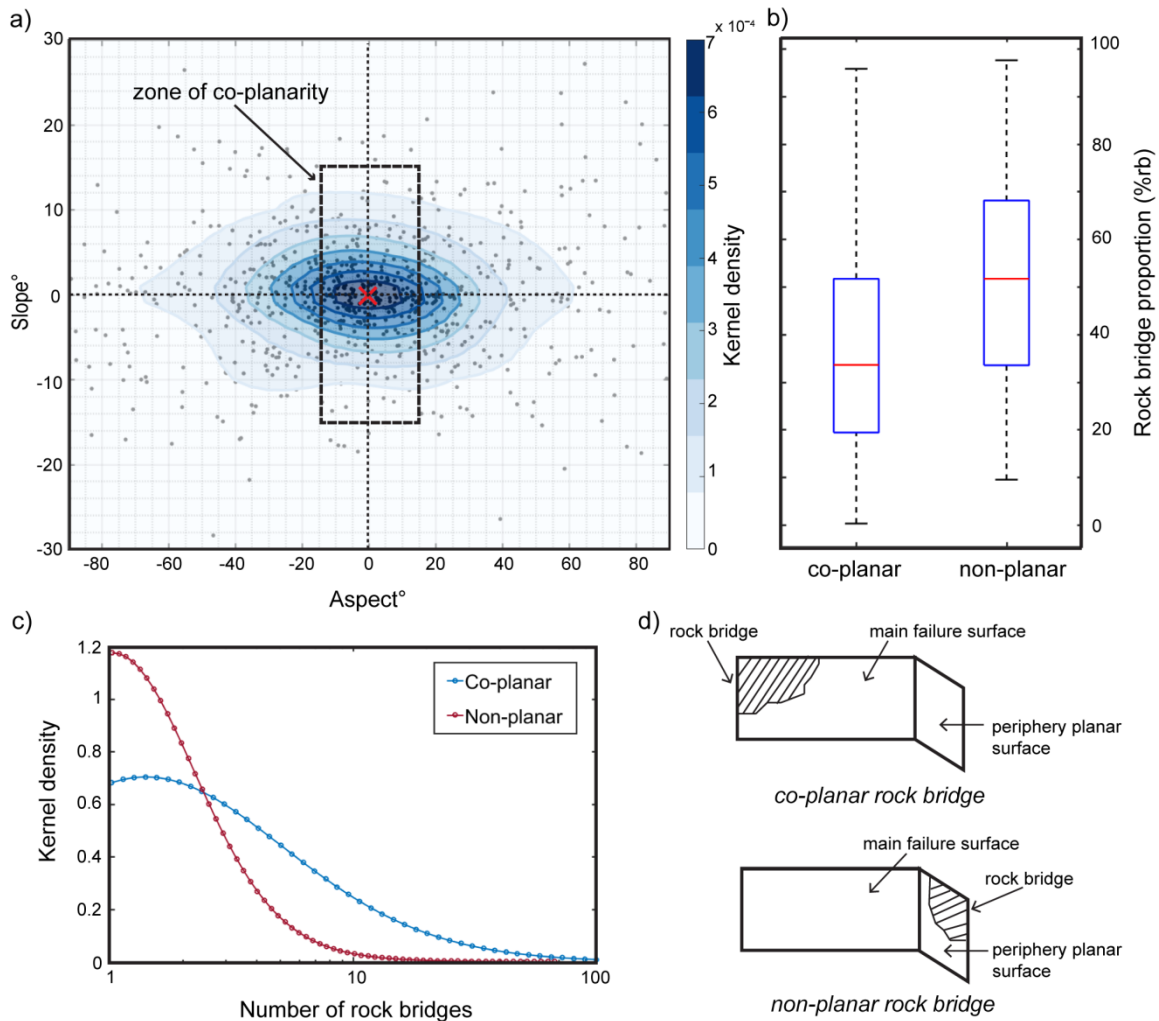


Figure 11: a) Kernel density plot displaying the difference in mean slope and mean aspect between rock bridge and the rockfall scar surface. Co-planarity defined as change in slope & aspect of $< 15^\circ$. b) Box plot displaying difference in %rb between co-planar and non-planar rock bridges. c) Kernel density plot of the number of rock bridges for either co-planar or non-planar rock bridges. d) Conceptual end-member examples of co-planar and non-planar rock bridges.

4.2.4 Rock bridge location

We normalise the coordinates of the position of the centre of the rock bridge relative to the coordinates of the 3D centre of mass projected back onto the cliff face for each rockfall. The centre of the rockfall is located at coordinates $\{1,1\}$, and rock bridge positions are displayed relative to this point (Figure 12). The highest density of rock bridges is generally located just above the rockfall centre of mass. Overall, more rock bridges are located above the rockfall centre of mass (52.4%), as opposed to below (47.6%), although this distinction is not clear. Rock bridges are however clustered around the projection of the rockfall centre of mass onto the cliff, with a decreasing density in bridge position with increasing radial distance relative to the scar extent. Rock bridges are broadly represented in all areas of the rockfall scar, except on the very periphery. Rock bridges therefore may not define the perimeter of the rockfall, but rather support a mass of which the extent is defined by the rock mass structure.

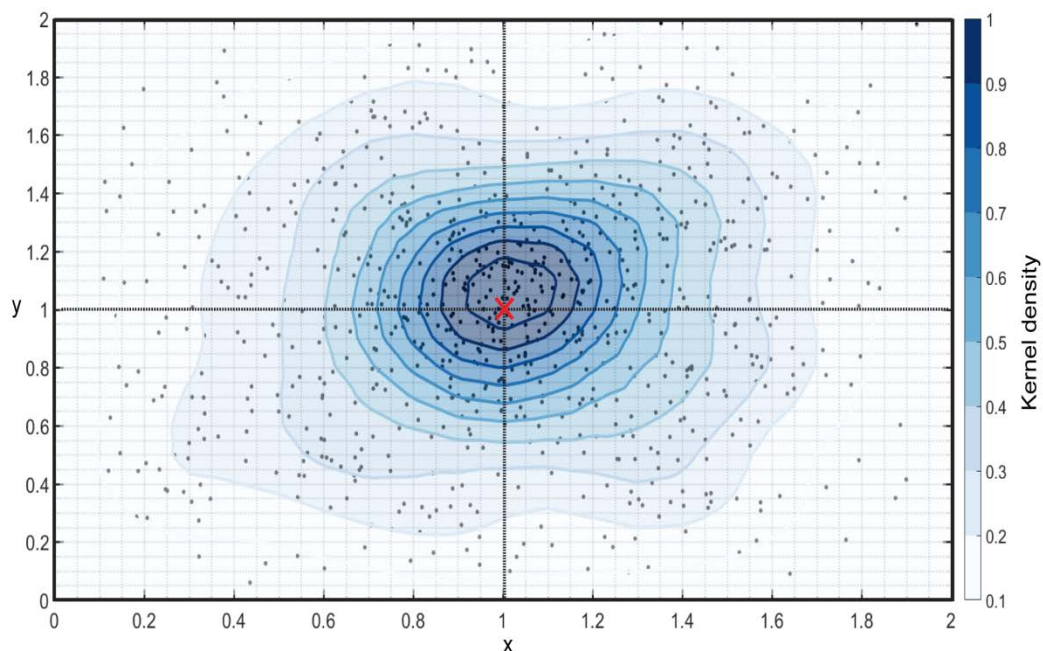


Figure 12: Kernel density plot of rock bridge centres normalised to the rockfall centre of mass. The rockfall centre is located at the x of 1, 1- with y values < 1 located below the rockfall centre and y values > 1 located above the rockfall centre.

5. Discussion

5.1 Rock bridge role in failure

Our results demonstrate that a wide range of $\%rb$ is possible within failures from the same rock type and structure. This holds across a range of rockfall sizes, but varies with source rock lithology. The mean $\%rb$ value of $31\% \pm 26\%$ is higher than previously reported for other rockfall scar analysis case studies, which invariably focus on larger volume events, often in more competent or massively jointed rock. Previous studies, comprising of individually mapped rockfall scars, displayed a range of 0.2% to 26% (Frayssines and Hantz, 2006; Lévy et al., 2010; Paronuzzi et al., 2016; Paronuzzi and Sera, 2009; Stock et al., 2012, 2011). Estimates obtained from discontinuity persistence mapping and back analysis modelling display a larger range of 1% to 45% (Elmo et al., 2011; Gischig et al., 2011; Grøneng et al., 2009; Karami et al., 2007; Matasci et al., 2015; Sturzenegger and Stead, 2012; Tuckey and Stead, 2016). All of these estimates, including our dataset, display a six order of magnitude range in rockfall size (from 0.01 m³ to 10,000 m³) and consider various rock types.

We suggest that the large recorded variance in $\%rb$, which we report here, is due to the spatial distribution of rock bridges within the slope, as determined by the persistence and spacing of discontinuities within the rock mass (Tuckey and Stead, 2016). To account for this variance, robust sensitivity analysis within modelling to determine failure susceptibility is needed. Through analysis of rockfall scars from the three rock types considered here, it is evident that lithology is an important control on rock mass strength in defining the nature of rock bridges, and even subtle changes in rock mass structure between the three lithological units results in significant $\%rb$ differences. This indicates that not only the wider geology, but also the local scale lithology changes control rock mass characteristics that are important controls in releasing blocks as rockfall. Joint density, a proxy for joint spacing, varies with bed thickness (e.g. Huang and Angelier, 1989; Ladeira and Price, 1981; Narr and Suppe, 1991), indicating that within interbedded sedimentary sequences rock bridge characteristics will vary as function of mechanical stratigraphy.

The distribution of these rock bridges influences the stress within the incipient failing mass, determining its eventual failure mode (Bonilla-Sierra et al., 2015; Stock et al., 2011). Our dataset demonstrates that most rockfalls in our inventory will contain a singular rock bridge, which may be located throughout the scar, except on its periphery, with an approximately equal location probability above or below the rockfall centre of mass. Bonilla-Sierra et al., (2015) modelled rock bridge location in relation to a translational failure. Higher concentrations of tensile cracking were associated with rock bridges located at the top of the failure surface, a steeper slope angle and a lower centre of mass. When the rock bridge is located above the centre of mass, and assuming simplified geometry, the force acting on the failure mass generates a bending moment that results in greater tensile cracking and associated rotation (Hibbeler, 2010). Conversely, shear cracking was associated with a more shallow failure surface and rock bridges located in the centre or lower parts of failure (Bonilla-Sierra et al., 2015). Using a similar simplification, we suggest that rockfalls with rock bridges located above the centre of mass likely fail predominantly in tension, while rockfalls with rock bridges in line with or below centre of mass are likely to predominantly fail in shear (Figure 13). The degree of deviation of rock bridge location from the rockfall centre needed to generate sufficient bending moment and associated tensile failure is unknown. Further modelling would reveal if even slight deviations in rock bridge location results in an imbalance of forces, affecting those acting on a failing block and resulting in a change to the dominant failure mode.

Additionally, rock bridges that are non-planar to the main failure surface or located to the side of the centre of mass introduce an element of twisting or torsion into the mechanical analysis, which is rarely considered within the 2-dimensional analysis of slope failure mechanics (e.g. Wyllie and Mah, 2004), but is standard practice for structural engineering (e.g. Hibbeler, 2010). These require a fully 3D approach to account for dilation and rotation of blocks within the rock mass. Analysis of the stresses experienced by the rock bridges will determine which strength characteristics, such as tensile or shear, are most important for

stability. We show here that with increasing rockfall size, more rock bridges are likely to be incorporated into the eventual failure surface. This increases the complexity of the forces acting on the incipient failure mass due to their multiple attachment points to the slope. This also highlights the potential for the sequential failure of one rock bridge at a time, and the subsequent transfer of and changes in the nature of stress on remaining intact bridges.

Our results show that smaller rockfalls containing <5 rock bridges are commonly dominated by one large main rock bridge, which dictates the potential for failure and release. The mechanical and compositional characteristics of this main bridge will determine its strength, and the magnitude and trajectory of stress required for failure to occur. Within a heterogeneous (sedimentary) lithology, small scale (10^{-3} m to 10^0 m) intrinsic flaws such as, micro-cracks, grain boundaries and sedimentary structures, such as ripples or concretions may predispose the rock bridge to failure by forming initiation points for micro- and macro-crack propagation (Kranz, 1983; McConaughy and Engelder, 2001; Pollard and Aydin, 1988). As such, the temporal behaviour of these smaller rockfalls may be difficult to predict.

As a failure develops, it remains unclear how the failure responds to, accommodates and incorporates smaller peripheral rock bridges, or includes the partial failure of larger rock bridge located on the edge of failure scar. In the case of a partial failure of a larger rock bridge, questions concerning controls on termination of fracture within that rock bridge and the impact on the dimensions of the failure mass are raised. This point of termination may be determined by intersecting cliff perpendicular discontinuities or non-persistent bedding, whereby fracture propagation deflects and stops at these boundaries due to changes in the near-field stresses experienced by the propagating crack tip, influenced by changes in lithological composition and mechanical interactions with discontinuities (Pollard and Aydin, 1988; Scavia, 1990). Therefore, discontinuity spacing may control rockfall geometry and the amount of partial and complete fracturing required through rock bridges contained within the incipient failure mass.

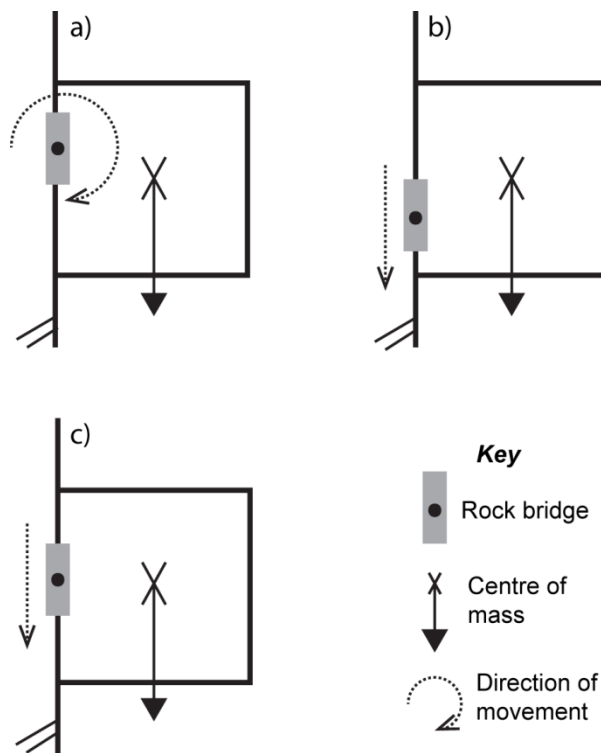


Figure 13: Conceptual model of rock bridge attachment points and potential failure directions. a) Rock bridges located above centre of mass may result in outward rotation of the incipient rockfall block and associated tensile failure. b) & c) Rock bridges located below centre of mass may fail in shear due to downward forces acting on the rock bridges.

5.1 Implications for progressive failure

For larger rockfalls, fracturing through each of the multiple rock bridges is required. The order through time in which rock bridges fracture remains poorly constrained, but is likely to be complex. This order must have important implications for progressive failure and stress redistribution within the incipient scar (Eberhardt et al., 2004; Kemeny, 2003; Stead et al., 2006). For instance, the fracture of minor rock bridges may result in significant enough changes to stress distribution to create instability, or it may only be the fracture of larger bridges that are the catalyst for acceleration towards final failure and block release. Fracturing may represent or may drive pre-failure deformation (e.g. Rosser et al, 2007;

Kromer et al., 2015) whereby observed surface deformation may be a manifestation of fracturing of rock bridges within the rock mass. Our analysis of %wrb distribution has indicated that substantial weathering of fractured rock bridges can occur before final failure, suggesting that pre-failure deformation may not always result in a sudden acceleration towards failure and may evolve over a period sufficiently long enough for weathering to take hold. In these circumstances the redistribution of stress may result in a new prolonged (quasi-)equilibrium state (Leroueil, 2001). Modelling of progressive failure may help understand this temporal pattern by accounting for the distribution of fracturing and stress between these multiple rock bridges (Stead et al., 2006).

Rockfall failure is commonly poorly correlated with environmental conditions and can occur entirely independently of environmental triggers (Lim et al., 2010; Rosser et al., 2007). However, smaller rockfalls ($< 0.1 \text{ m}^3$) can be more successfully correlated to, for example, mean air temperature and wind velocity (Lim et al., 2010). These correlations may exist for small rockfalls that display no rock bridges, and as such require no fracturing through intact rock to instigate release. For rockfalls with rock bridges, some form of rock strength weakening is needed for failure to occur at low magnitude environmental stress triggers that are otherwise insufficient to fracture intact rock (Gunzburger et al., 2005). This weakening is likely to be driven by processes such as weathering or stress redistribution as described here (Collins and Stock, 2016; Gunzburger et al., 2005; Viles, 2013). These processes can create stress fluctuations within the slope that drive the development and coalescence of micro-cracks, eventually reducing the strength of rock to the point of failure (Attewell and Farmer, 1973; Cruden, 1974; Stock et al., 2012).

Our analysis shows that the rockfalls considered here display a wide range of exposure to weathering prior to failure, as represented by the variation in %w and %wrb. However, not all discontinuity surfaces may be weathered, with the prevalence determined by the connectivity of the discontinuity sets and the intensity and efficacy of environmental conditions acting on and within the slope. The relationship between this exposure and connectivity influences

weakening within the slope (Gischig et al., 2011; Viles, 2013). Weathering at the interface between a rock bridge and a discontinuity, known as the crack tip, where stress is concentrated, is an important control on weakening and fracture propagation (Collins and Stock, 2016). The rock bridge perimeter to rock bridge area ratio must to some extent dictate this rate of weakening of rock bridges. For example, two slopes with the same overall rock bridge proportion may weaken at different rates depending on rock bridge size, shape, area and distribution. A slope that contains smaller but more abundant rock bridges may weaken at a faster rate due to high perimeter to area ratio.

As attachment points to the slope, rock bridges represent zones of stress concentration. Recent research has shown a complex relationship between weathering and stress prior to failure, which suggests that stress concentrations may either enhance or dampen the efficiency of weathering events (Brain et al., 2014; Bruthans et al., 2014). Understanding the stress regime that rock bridges experience can determine their temporal and spatial response to weakening (Kemeny, 2003). Micro-cracks may be preferentially oriented with respect to the applied stress (Brain et al., 2014), impacting overall strength. For example mode 1 cracking will reduce tensile intact rock strength. The models presented by Scavia and Castelli (1996) indicate that fracture propagation is dependent on rock bridge size, with larger rock bridges requiring tensile σ_3 conditions - the minimum principal stress, for fracture to occur. Defining rock bridge proportion and distribution, along with failure mode, is critical for assessing the failure stress regime. The exact nature of feedbacks between weakening, the stress regime and individual failures, and how these interactions drive the propagation of further failure requires detailed quantification. These interactions affect the timing of rockfall failure, which holds implications for the frequency and magnitude of rockfall activity, a critical input of hazard assessments (Fell et al., 2008) and slope erosion rate calculations (Barlow et al., 2012; Dussauge et al., 2003; Malamud et al., 2004).

5.2 Influence on rock mass strength

We observe that while most rock bridges are co-planar to the main failure surface, ~30% are not. These non-planar rock bridges may represent fracturing through intact rock along discontinuity sets, or the partial fracturing of peripheral rock bridges co-planar to the failure surface. Non-planar rock bridges are largely absent from larger rockfalls, suggesting that they are representative of partial fracturing through peripheral rock bridges, or that they have been subsumed into the failed mass and so are not visible within our analysis. This indicates that most rock bridges are located co-planar to the main failure surface, which in this instance is cliff parallel. The prevalence of rock bridges along cliff parallel discontinuities may be related to the conditions of joint formation. These cliff-parallel joints may be formed in response to local scale topographic stress and slope curvature (Gerber and Schiedegger, 1969; Martel, 2017). It is unlikely that these discontinuities represent large scale sheeting joints, like those observed in the granitic rocks of Yosemite valley, due to the lower magnitude of overburden stress and weaker lithologic characteristics of the rocks considered here (Martel, 2017). We however assume that smaller scale topographic stresses may generate smaller scale fracturing comparable in form if not scale.

These localised topographic stresses may result in an intermittent smaller-scale joint propagation. Additionally, as joint density increases within a rock mass, the interactions between the individual joints inhibit each other's expansion (Pollard and Aydin, 1988), by changing the stress intensity factor of the propagating crack tip of a joint (Scavia, 1990). This results in less persistent but higher density jointing with a greater prevalence of rock bridges, distributed in distinct zones within the slope. In contrast, intersecting joints, which may have been formed by larger regional scale stresses associated with tectonics and uplift, may be more persistent separated by larger rock bridges (Brideau et al., 2009; Tuckey and Stead, 2016). Our analysis reveals that non-planar bridges account for a higher proportion of scar surface area. Therefore, the spatial prevalence and pattern of rock bridges within a slope is related to its rock mass strength characteristics as determined by joint type. The propagation

and persistence of joints in turn is influenced by lithology (Pollard and Aydin, 1988). Defining the conditions of joint formation and their resulting characteristics will enhance our understanding of rock mass strength (Moore et al., 2009). Consequently, this has implications for slope evolution, with numerous studies outlining the influence of rock mass strength on differential slope forms (Augustinus, 1992; Moore et al., 2009; Selby, 1982). Understanding the intrinsic properties of rock mass strength, as represented by rock bridges, discontinuities and weathering, will better inform the parameters of larger scale landscape evolution models (Moore et al., 2009).

6. Conclusions

We present the first large scale database of rock bridge and rockfall scar weathering characteristics (0.1 m² to 27 m²). Our analysis reveals:

- Rock bridges account for 31% \pm 26% of failure scar surface area. The wide range in %rb is related to subtle changes in lithology and rock mass structure.
- Failure mode is dependent on the imbalance of mass created by the deviation between the rockfall centre and rock bridge attachment point. This point may be subjected to tensile, shear and torsional stresses, which influences the parameter of strength critical for stability. 3D modelling is required to provide a comprehensive slope stability analysis.
- The number of rock bridges within a scar, and associated failure complexity, increase linearly with rockfall size. The majority of rockfalls are dominated by one main rock bridge, which is critical for maintaining stability. For larger rockfalls to fail, progressive failure and fracturing is likely required through multiple rock bridges. Through time the stress applied to each rock bridge may change as it tends towards being the next in sequence to fail.
- Rock bridges must have been weakened prior to failure, with the rock bridge

perimeter to area ratio determining weathering exposure at the discontinuity/rock bridge boundary. Not only is rock bridge proportion a control on stability, but other rock bridge attributes are important to provide a full explanation of the spatial and temporal occurrence of failure.

- Rock bridges provide controls on the mode, spatial pattern, and temporal behaviour of failure, which influences slope stability as a whole.

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